

Adaptive Optics (AO)

(and, en passant, also intro to image formation and atmospheric turbulence)

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(Credit: Markus Feldt, Max Planck Institut für Astronomie — Heidelberg, 2025)

→ https://www2.mpi-a-hd.mpg.de/homes/feldt/post/02_adaptive_optics/

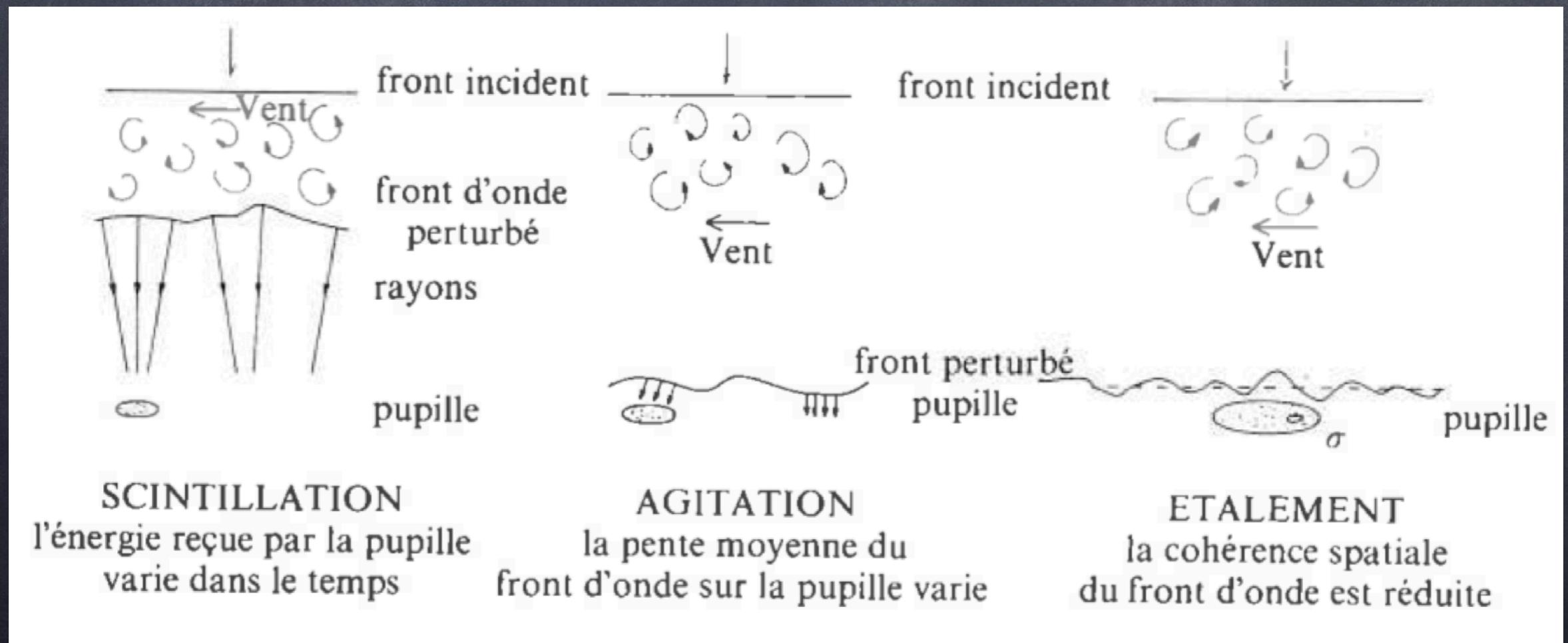
Menu

- High-angular resolution imaging in astronomy
- Atmospheric turbulence
- Numerical modelling of perturbed wavefronts
- Formation of resulting images (+detection noises)
- AO error budget
- Post-AO point-spread function morphology
- Wavefront sensors
- Deformable mirrors
- Reconstruction and control of the command
- Numerical modelling of a complete AO system

Images & turbulence — 01

The image formed through turbulent atmosphere (optically speaking) is degraded:

- Scintillation (due to intensity fluctuation in the pupil).
- Agitation (due to angle-of-arrival variation).
- Spreading (due to a loss of spatial coherence).



Images & turbulence — 02

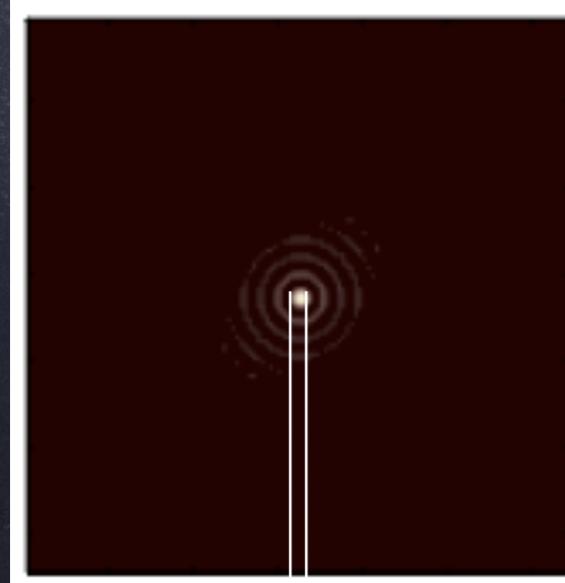
The object-image relation between the intensity $I(\alpha)$ in the image plane (i.e. the focal plane of the telescope) and the brightness $O(\alpha)$ of the object (in the sky) is a relation of convolution implying the point-spread function (PSF) $S(\alpha)$ of the whole ensemble telescope+atmosphere, with α the angular coordinates in the focal plane:

$$I(\vec{\alpha}) = O(\vec{\alpha}) * S(\vec{\alpha})$$

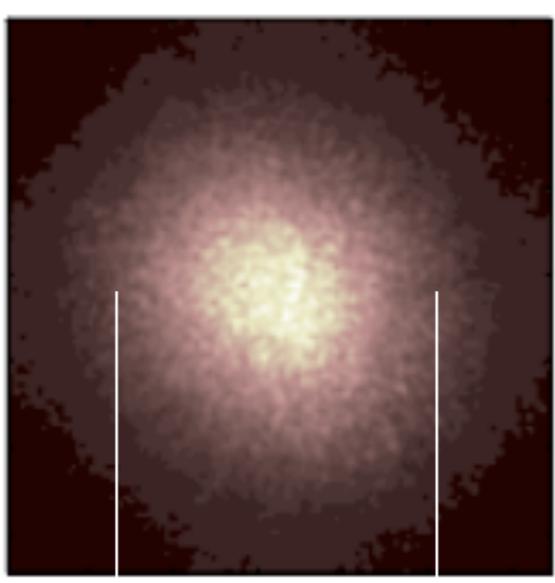
Images & turbulence — 03

$$I(\vec{a}) = O(\vec{a}) * S(\vec{a})$$

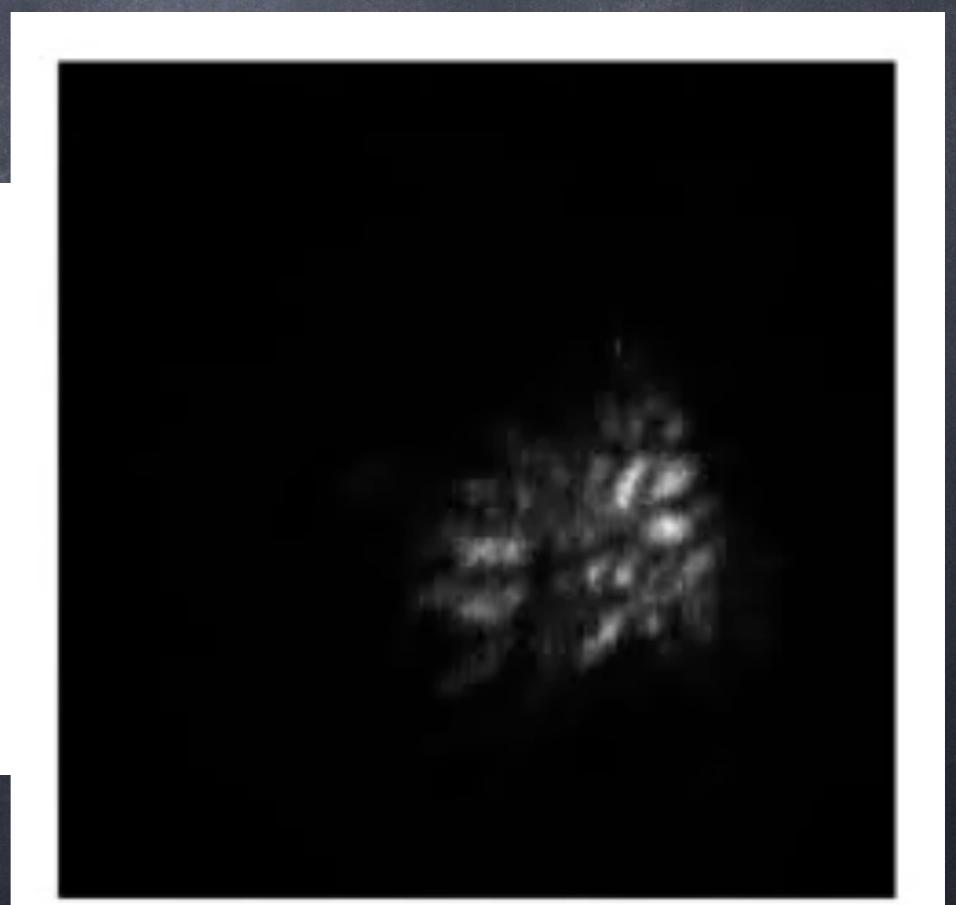
This relation is valid notably at the condition that the system is invariant by translation (everything happens within the isoplanatic domain)...



λD



λr_0



Images & turbulence — 04

Some orders of magnitude concerning the turbulent atmosphere:

$$\lambda = 500 \text{ nm}$$

$$\lambda = 2.2 \mu\text{m}$$

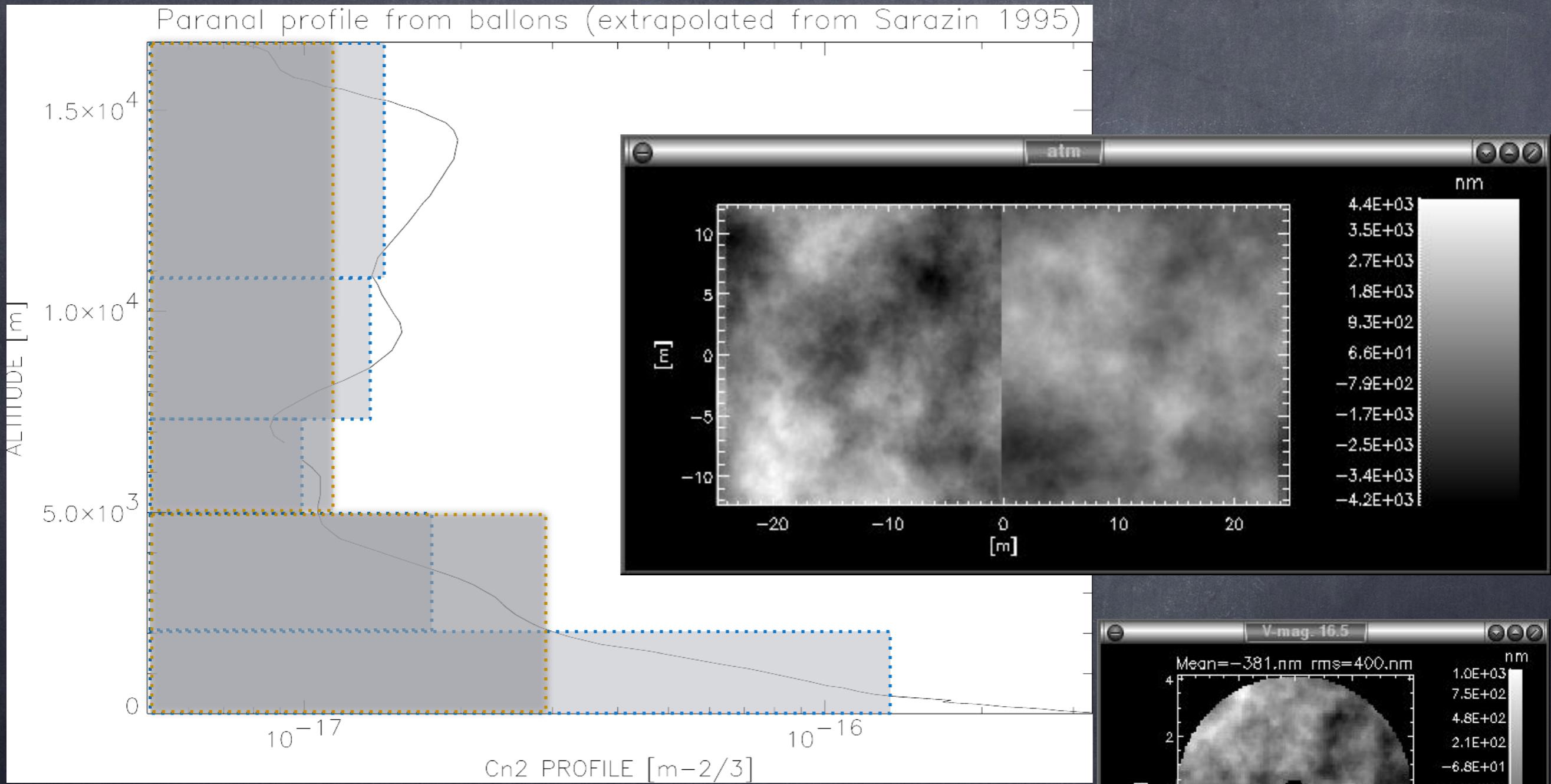
Fried parameter (r_0) → 10 cm 60 cm

velocity of the turbulent layers (v) → 10 m/s id.

=> image FWHM ($\epsilon \approx \lambda/r_0$) → 1" ~1"

=> evolution time ($\tau_0 \propto r_0/v$) → 3 ms 18 ms

Images & turbulence — 05



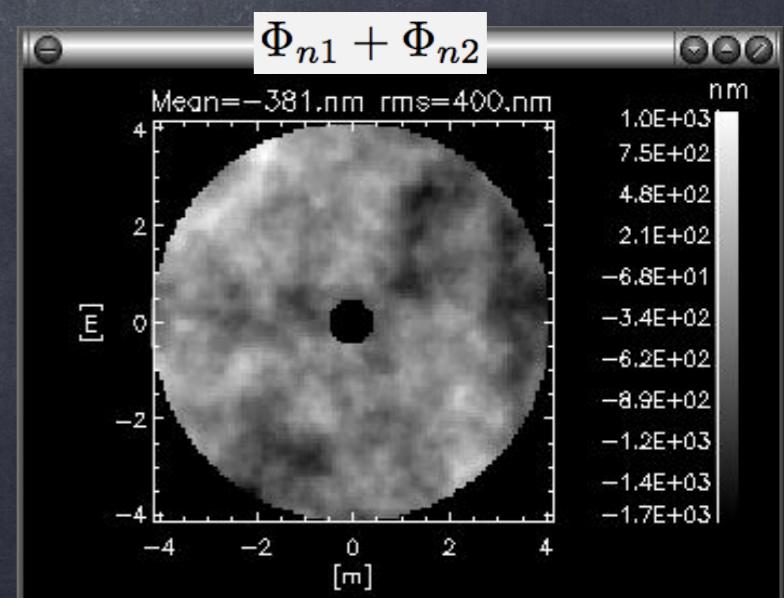
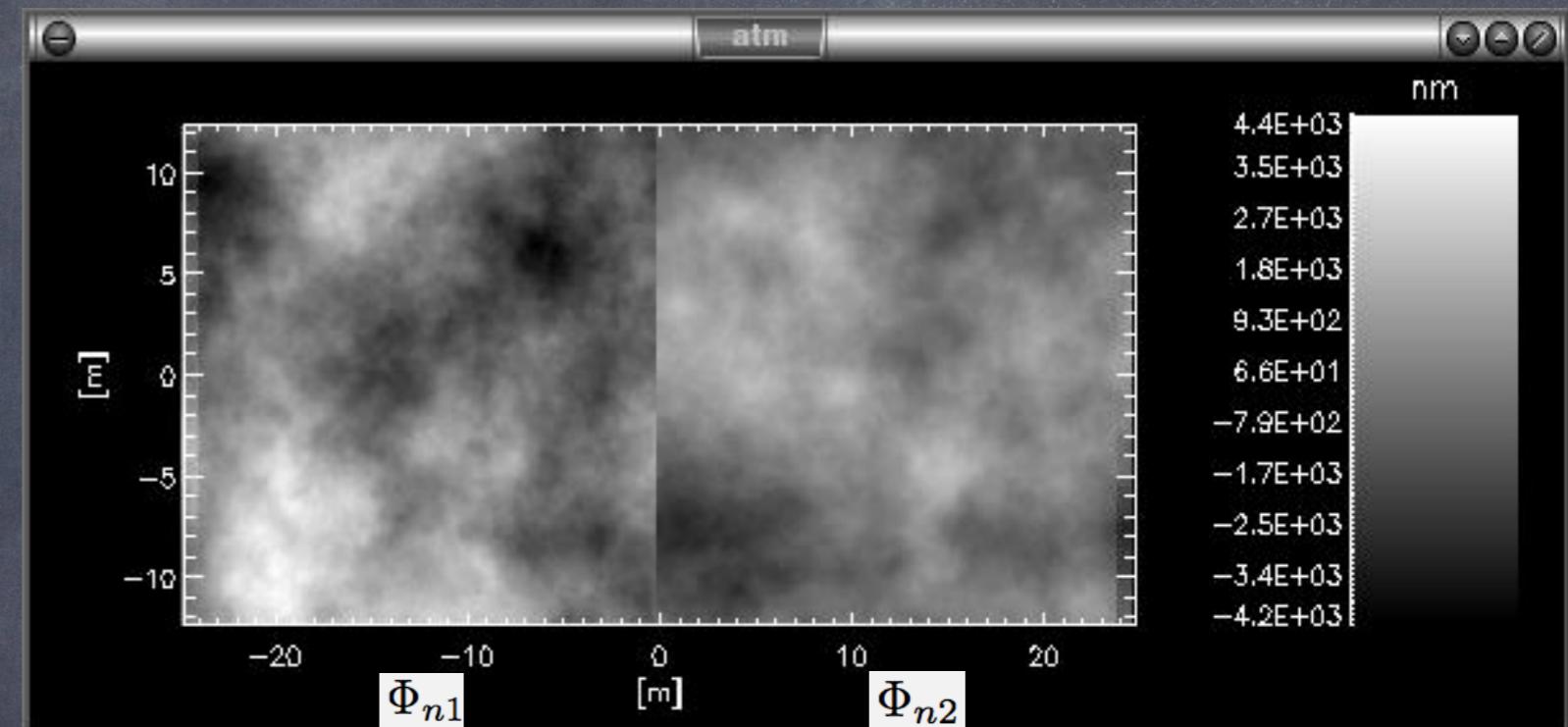
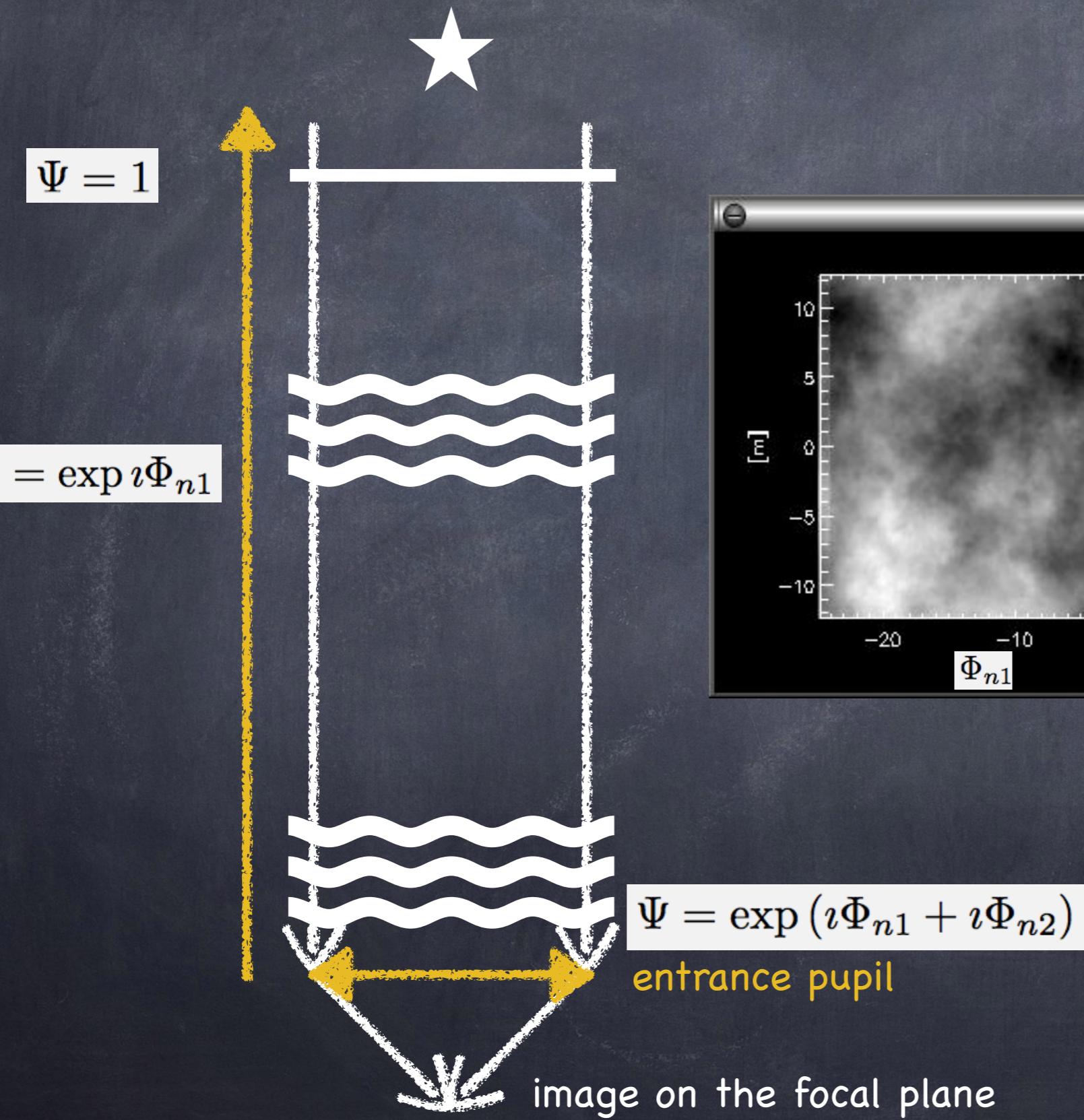
Profile of the refractive index structure constant $C_n^2(h)$

= measure of the intensity of optical turbulence in function of the altitude h

= constante de structure $C_n^2(h)$ des fluctuations d'indice de réfraction de l'air

(F. Roddier, 1981)

Images & turbulence — 06



Images & turbulence – 07

entrance pupil



image on the focal plane



Images & turbulence — 08

The wavefront is, modulo $\lambda/2\pi$, proportional to the phase $\Phi(\vec{r})$ of the wave $\Psi(\vec{r})$ which has went through the turbulent atmosphere before reaching the telescope:

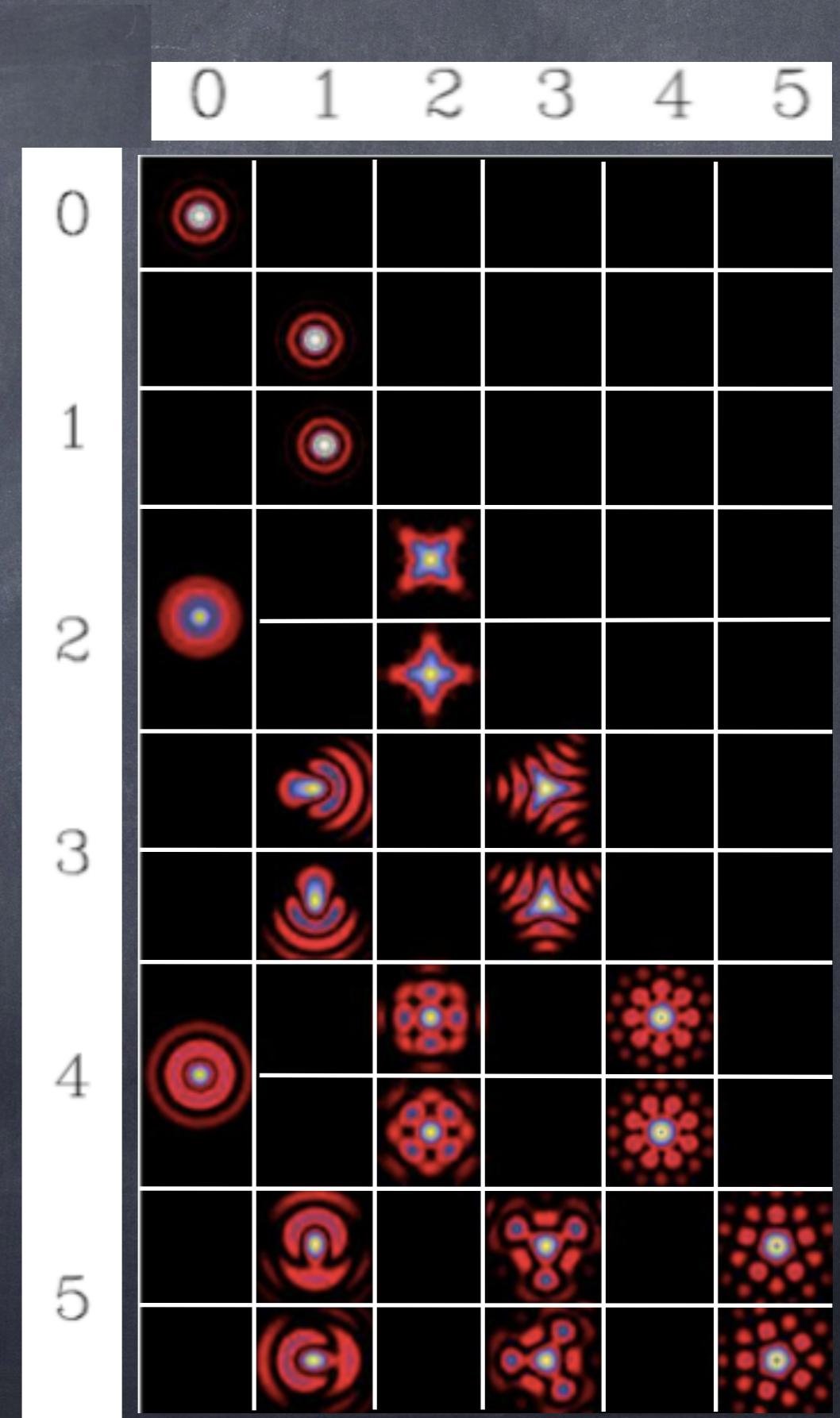
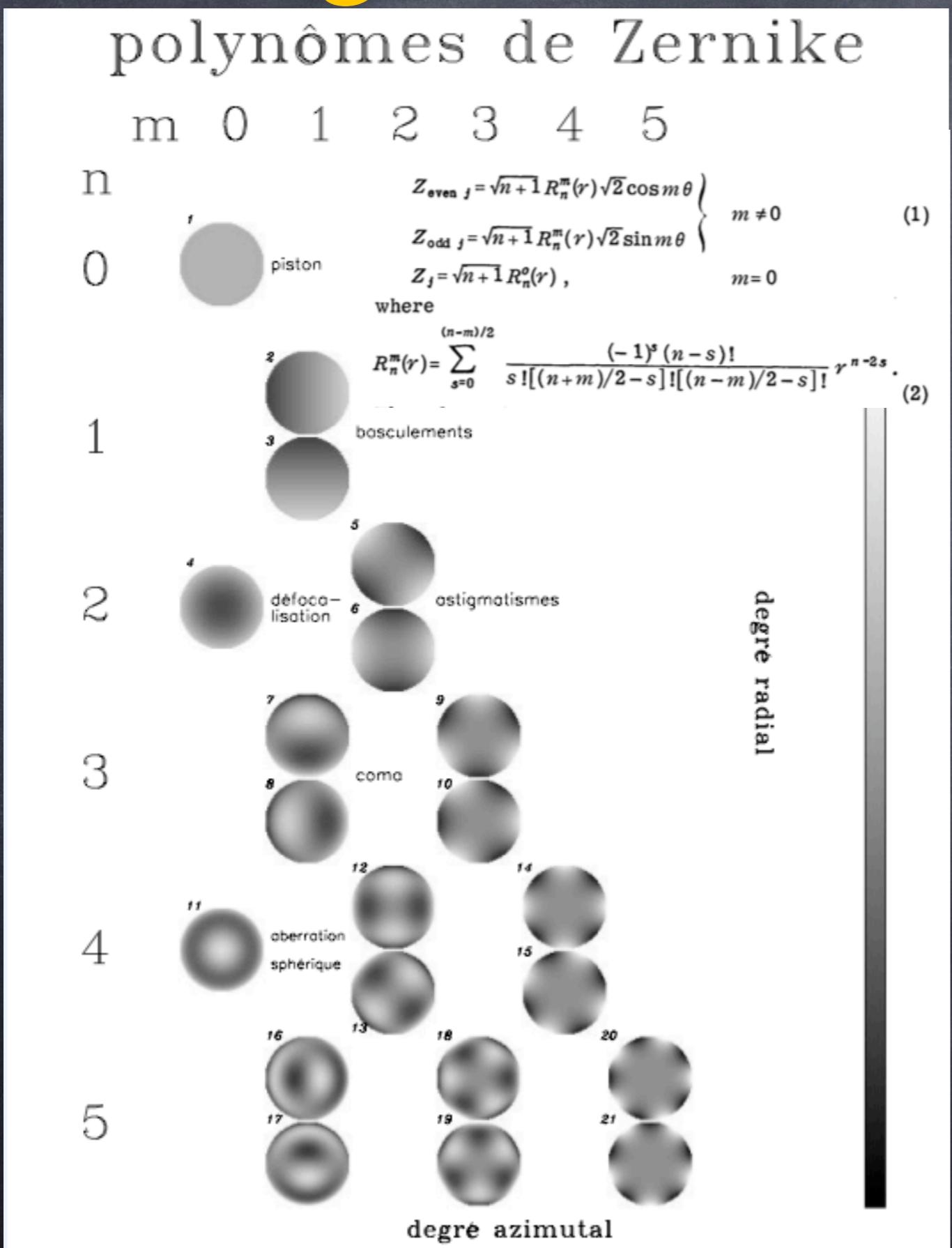
$$\Psi(\vec{r}) = A(\vec{r}) \exp\{\imath\Phi(\vec{r})\}$$

Note that this phase can be decomposed following a base of polynomials, for example Zernike ones:

$$\Phi(\vec{r}) = \sum_i a_i Z_i(\vec{r})$$

Images & turbulence — 09

entrée pupil



Images & turbulence — 10

turbulence intensity [m^{-2/3}]

$$r_0 = 0.185 \lambda^{\frac{6}{5}} \cos(\gamma)^{\frac{3}{5}} \left[\int_0^{\infty} C_n^2(z) dz \right]^{-\frac{3}{5}}$$

(D.L.Fried 1955, F.Roddier 1981)

=> r0 in band H knowing that r₀@500nm = 10cm ?

$$\tau_0 = 0.36 \frac{r_0}{\bar{v}}$$

$$\epsilon_0 = 0.98 \frac{\lambda}{r_0}$$

$$\theta_0 = 0.314 \frac{r_0}{\bar{h}}$$

$$\bar{v} = \left(\frac{\int C_n^2(h) v(h)^{\frac{5}{3}} dh}{\int C_n^2(h) dh} \right)^{\frac{3}{5}}$$

$$N_s \simeq 0.34 \left(\frac{D}{r_0} \right)^2$$

$$\bar{h} = \left(\frac{\int C_n^2(h) h^{\frac{5}{3}} dh}{\int C_n^2(h) dh} \right)^{\frac{3}{5}}$$

Number of speckles for r₀=10cm and D=1m ?

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r_0 in band H knowing r_0 at 500nm ?...

$$r_0 = 0.185 \lambda^{\frac{6}{5}} \cos(\gamma)^{\frac{3}{5}} \left[\int_0^\infty C_n^2(z) dz \right]^{-\frac{3}{5}}$$

$$r_0^{H=1.65 \mu\text{m}} = r_0^{500 \text{ nm}} \left(\frac{1.65}{0.5} \right)^{\frac{6}{5}} \simeq 0.42$$

Number of speckles for $r_0=10\text{cm}$ and $D=1\text{m}$?...

$$N_S^{500 \text{ nm}} \simeq 0.34 \left(\frac{1.0}{0.1} \right)^2 \simeq 34$$

$$N_S^H \simeq 0.34 \left(\frac{1.0}{0.42} \right)^2 \simeq 2$$

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$$\Phi_\varphi(\vec{\nu}) = 0.0228 \ r_0^{-\frac{5}{3}} \left(\nu^2 + \frac{1}{\mathcal{L}_0^2} \right)^{-\frac{11}{6}}$$

Power Spectral Density (PSD) of the phase, function of the spatial frequency

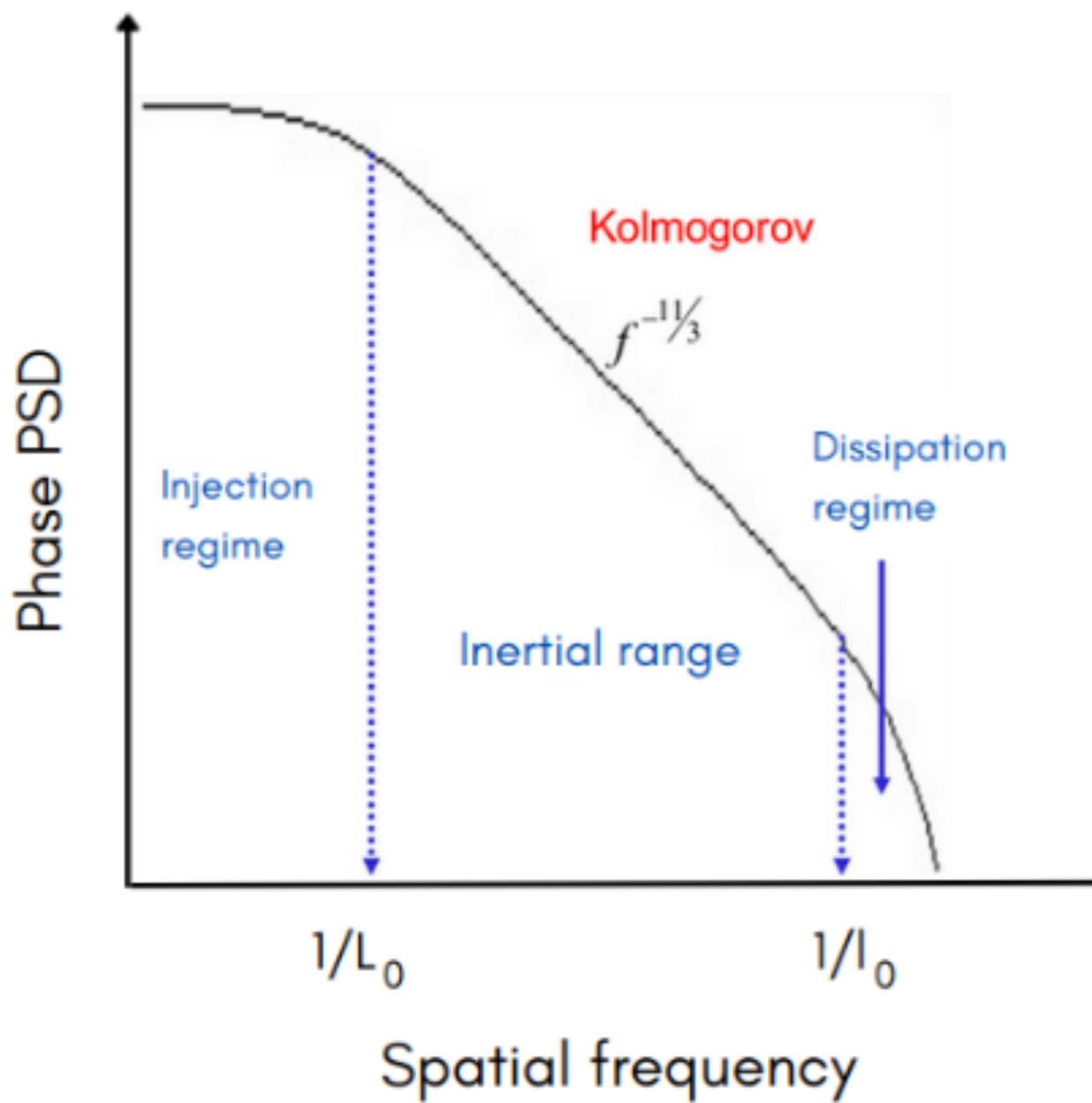
Kolmogorov/von Kármán model

- Kolmogorov : outer scale of turbulence \mathcal{L}_0 is infinite.
- One can refine the model by considering also ℓ_0 .
- \exists other models with a finite \mathcal{L}_0 (and a non-zero ℓ_0).

Energy cascade: wind shear => turbulent energy injected into the system via a large eddy (\mathcal{L}_0) which splits into smaller and smaller eddies (ℓ_0), and is finally viscously dissipated. Interval $[\ell_0, \mathcal{L}_0]$ = inertial range.

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$$\Phi_\varphi(\vec{\nu}) = 0.0228 r_0^{-\frac{5}{3}} \left(\nu^2 + \frac{1}{\mathcal{L}_0^2} \right)^{-\frac{11}{6}}$$

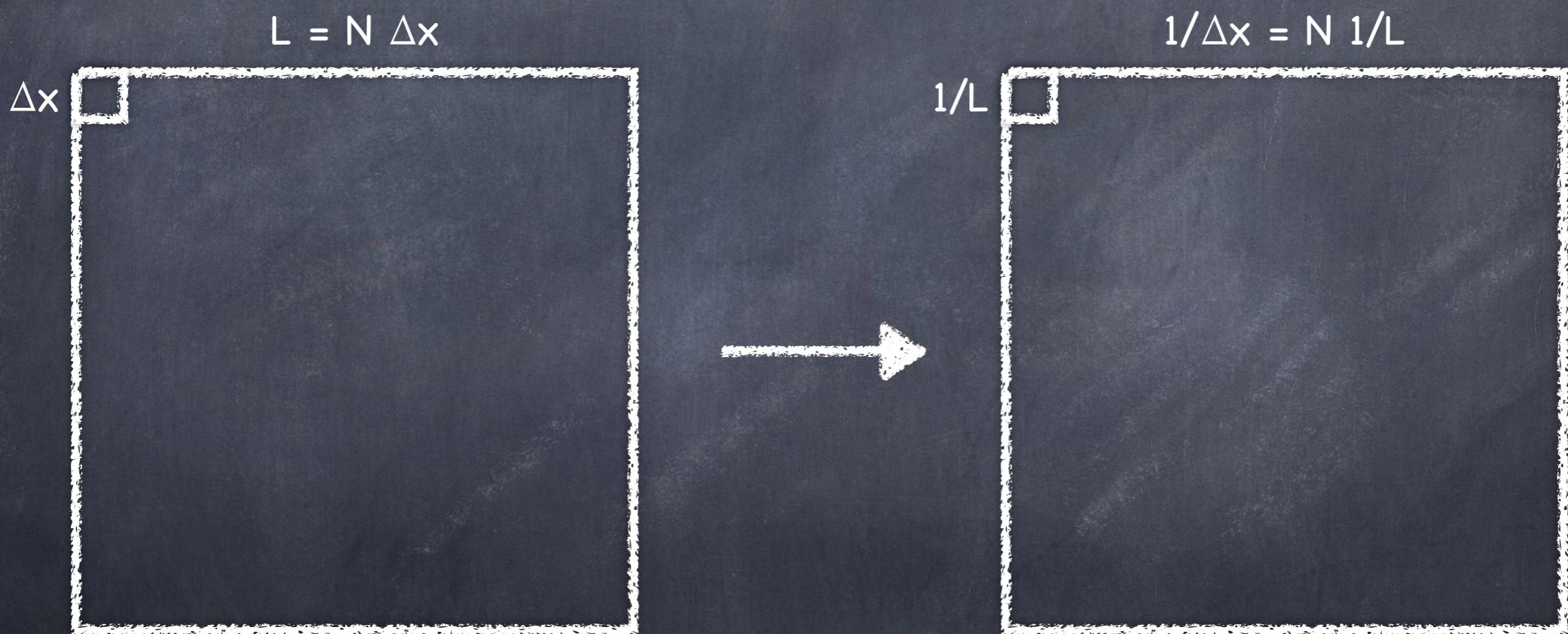


Energy cascade:

wind shear => turbulent energy injected into the system via a large eddy (\mathcal{L}_0) which splits into smaller and smaller eddies (l_0), and is finally viscously dissipated.

Interval $[l_0, \mathcal{L}_0]$ = inertial range.

(A reminder of discrete Fourier transform (DFT) ...)



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$$\Phi_\varphi(\vec{\nu}) = 0.0228 r_0^{-\frac{5}{3}} \left(\nu^2 + \frac{1}{\mathcal{L}_0^2} \right)^{-\frac{11}{6}}$$

Which, numerically written, and by considering wavefronts made of ‘dim’ pixels corresponding to ‘L’ meters, becomes:
(re-writing - “de-dimensionalizing” - the equation with $L_0=L_0 L/L$ and $\nu=\nu L/L\dots$)

```
freq = findgen(dim)
dsp = .0228*(L/r0)^(5/3.)*L^2*(freq^2+(L/L0)^2)^(-11./6)
```

And which (with the right frequency scale) can be plot with:

```
plot_oo, 1./L*findgen(dim), dsp, XR=[1/L/1.2,dim*1/L*1.2], /XS
```

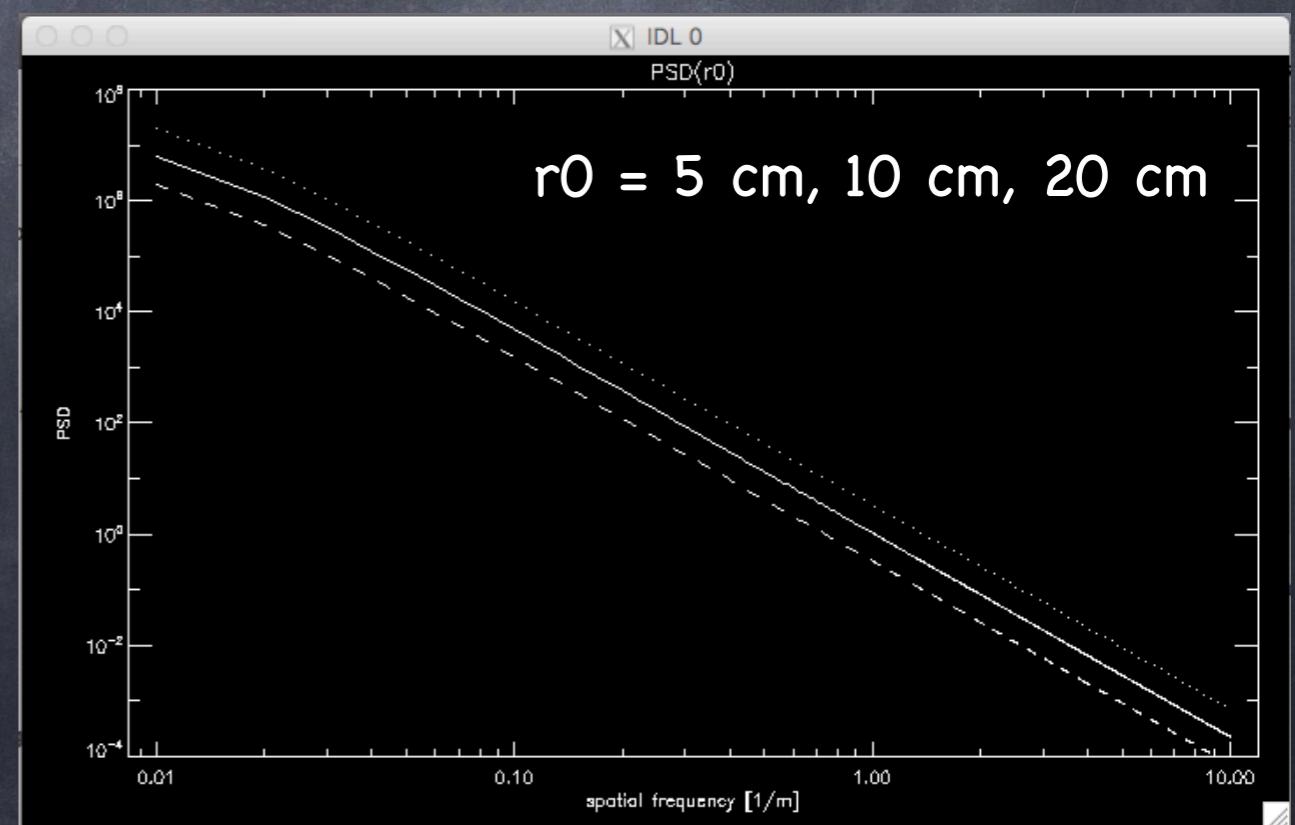
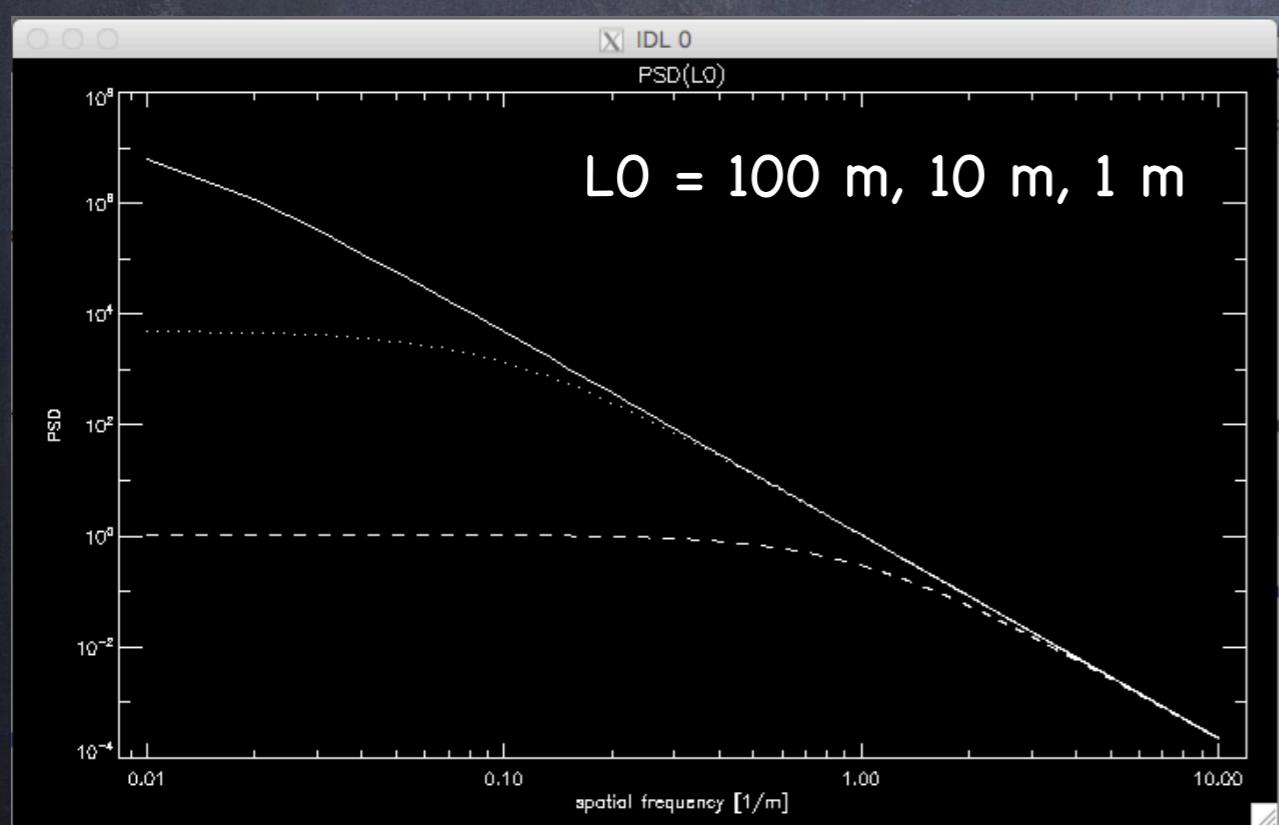
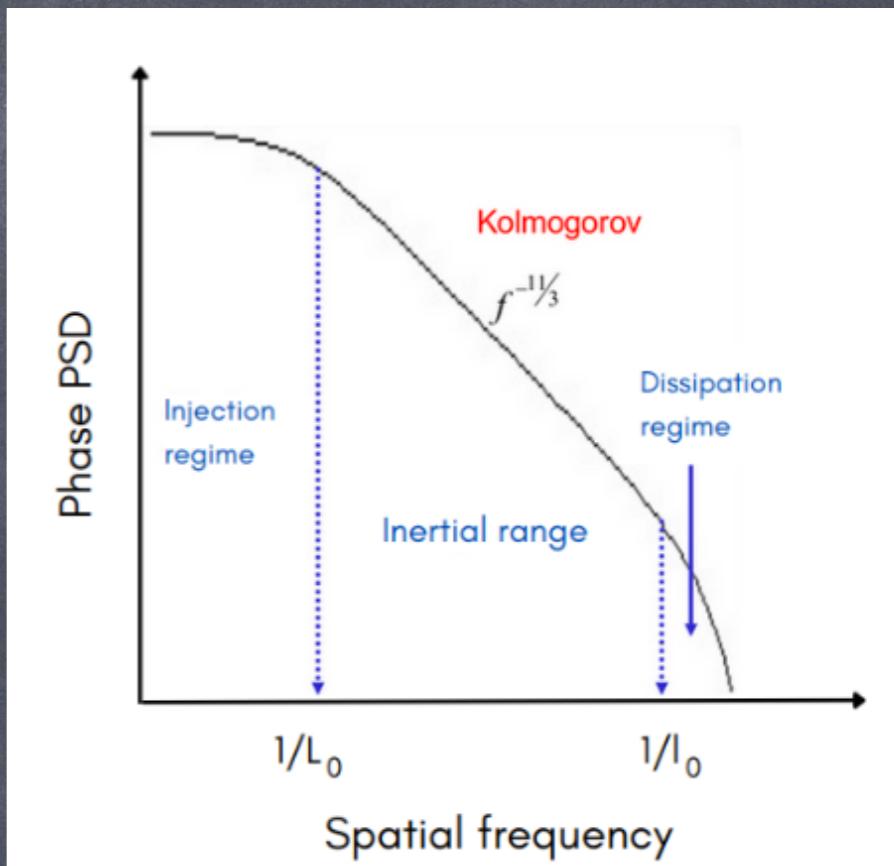
=> make a function that computes $\text{PSD}(L_0, r_0, \text{dim}, L)$ and plot it for different $[r_0, L_0]\dots$ [with, for example: dim=1000, L=100., r0=0.1, L0=100.,10.,1.]

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```

1 function dsp_theo, dim, L, r0, L0
2 ;
3 ; dim = array linear dimension [px]
4 ; L   = array physical length [m]
5 ; r0  = phase screen Fried parameter [m]
6 ; L0  = phase screen outer scale [m]
7 ; use: dsp=dsp_theo(dim,L,r0,L0)
8 ; to be plotted afterwards with:
9 ; plot_oo, 1./L*findgen(dim), dsp, XR=[1/L/1.2,dim*1/L*1.2], /XS, $
10 ;          YR=[0.1, 1E7], TIT='PSD(L0)', XTIT='freq. [1/m]', YTIT='PSD'
11 ; oplot , 1./L*findgen(dim), dsp, LINE=1
12 ; playing, e.g., with L0=100.,10.,1., or r0=.05, .1, .2
13 ;
14 freq = findgen(dim)
15 dsp  = .0228*(L/r0)^(5/3.)*L^2*(freq^2+(L/L0)^2)^(-11./6)
16
17 return, dsp
end

```



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-> For next time: read Aime
(Sec. 1 & Sec. 2) and Maire
(Chap.1)...

Chapitre 1 Introduction

Jérôme Maire, PhD
thesis (in French), chap.1

INSTITUTE OF PHYSICS PUBLISHING

Eur. J. Phys. 22 (2001) 169–184

EUROPEAN JOURNAL OF PHYSICS

www.iop.org/Journals/ej PII: S0143-0807(01)14580-0

Teaching astronomical speckle techniques

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Received 7 June 2000, in final form 6 December 2000

Abstract

This paper gives an introduction to speckle techniques developed for high angular-resolution imagery in astronomy. The presentation is focussed on fundamental aspects of the techniques of Labeyrie and Weigelt. The formalism used is that of Fourier optics and statistical optics, and corresponds to graduate level. Several new approaches of known results are presented. An operator formalism is used to identify similar regions of the bispectrum. The relationship between the bispectrum and the phase closure technique is presented in an original geometrical way. Effects of photodetection are treated using simple Poisson statistics. Realistic simulations of astronomical speckle patterns illustrate the presentation.

Long Telescopes may cause Objects to appear brighter and larger than short ones can do, but they cannot be so formed as to take away the confusion of the Rays which arises from the Tremors of the Atmosphere.

I. Newton, *1717 Optics, Sec. Ed., Book I, Part I, Prop. VIII*

also have a look here [A. Tokovinin
tutorial on atm'c turbulence]:

[https://www.ctio.noirlab.edu/
~atokovin/tutorial/part1/turb.html](https://www.ctio.noirlab.edu/~atokovin/tutorial/part1/turb.html)

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-> Perturbed wavefront generation

The well-known FFT method allows us to generate phase screens $\varphi(\vec{r})$, where \vec{r} is the two-dimensional position within the phase screen, assuming usually either a Kolmogorov or a von Karman spectrum $\Phi_\varphi(\vec{\nu})$, where $\vec{\nu}$ is the two-dimensional spatial frequency, from which is computed the modulus of $\tilde{\varphi}(\vec{\nu})$, the Fourier transform of $\varphi(\vec{r})$. Assuming the near-field approximation and small phase perturbation [3], the von Karman/Kolmogorov spectrum is given by

$$\Phi_\varphi(\vec{\nu}) = 0.0229 r_0^{-\frac{5}{3}} \left(\nu^2 + \frac{1}{\mathcal{L}_0^2} \right)^{-\frac{11}{6}}, \quad (1)$$

where r_0 is the Fried parameter and \mathcal{L}_0 is the wave-front outer scale (infinite for the Kolmogorov model). Within the framework of the classical FFT-based technique, a turbulent phase screen $\varphi_L(\vec{r})$ of physical length L is obtained by taking the inverse FFT of $\tilde{\varphi}_L(\vec{\nu})$, the modulus of which is obtained from Eq. (1) by applying the definition of the power spectrum, which is

$$\begin{aligned} \Phi_\varphi(\vec{\nu}) &= \lim_{L \rightarrow \infty} \left(\frac{\langle |\tilde{\varphi}_L(\vec{\nu})|^2 \rangle}{L^2} \right) \\ &\Rightarrow |\tilde{\varphi}_L(\vec{\nu})| \simeq L r_0^{-\frac{5}{6}} \sqrt{0.0228} \left(\nu^2 + \frac{1}{\mathcal{L}_0^2} \right)^{-\frac{11}{12}}, \end{aligned} \quad (2)$$

and which phase is random and uniformly distributed.

(From Carbillot & Riccardi, sec. 2: read it as well...)

(the same manipulation as before is applied here in order to obtain the numerical formulation here below.)

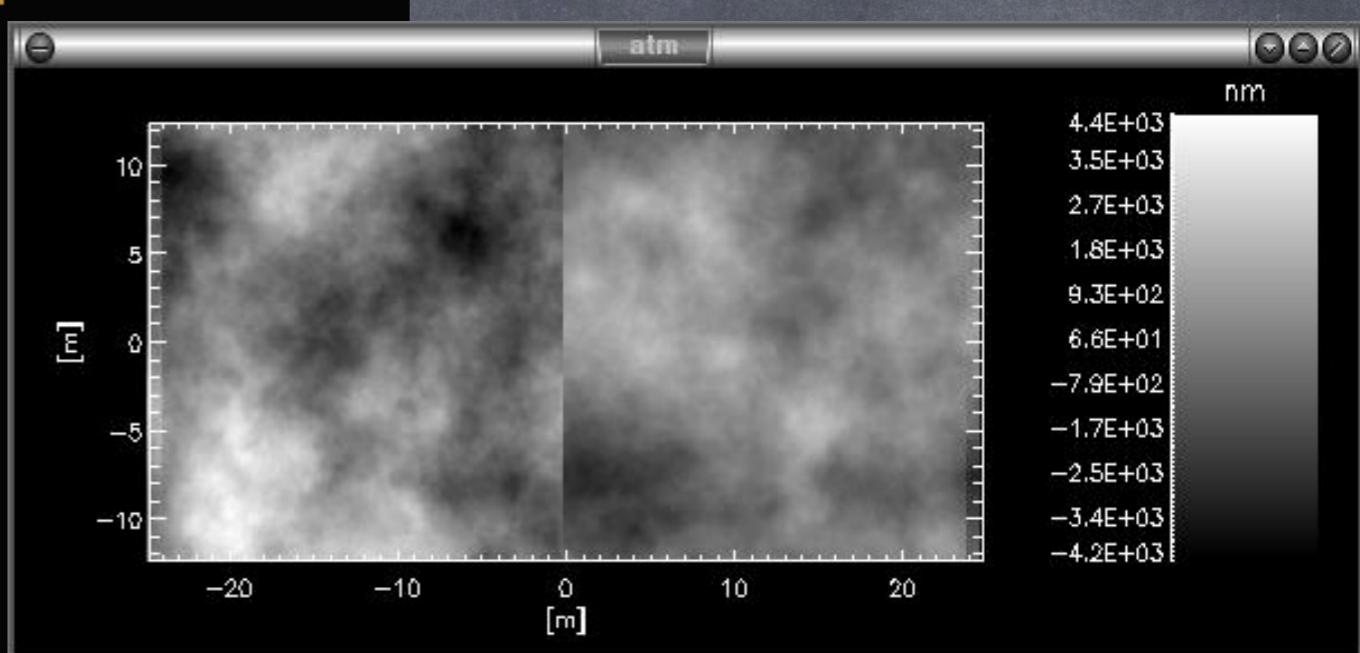
The obtained phase screen is thus numerically written

$$\begin{aligned} \varphi_L(i,j) &= \sqrt{2} \sqrt{0.0228} \left(\frac{L}{r_0} \right)^{\frac{5}{6}} \left\{ \text{FFT}^{-1} \left[\left(k^2 + l^2 \right. \right. \right. \\ &\quad \left. \left. \left. + \left(\frac{L}{\mathcal{L}_0} \right)^2 \right)^{-\frac{11}{12}} \exp\{i\theta(k,l)\} \right] \right\}, \end{aligned} \quad (3)$$

where i and j are the indices in the direct space, k and l are the indices in the FFT space, $\{\}$ stands for either *real part of* or *imaginary part of*, i is the imaginary unit, and θ is the random uniformly distributed phase (between $-\pi$ and π). The factor $\sqrt{2}$ comes from the fact that here we use both the real and imaginary parts of the original complex generated FFT phase screens, which are independent one from the other [4]. This kind of phase screen suffers, however, from the lack of spatial frequencies lower than the inverse of the necessarily finite length L of the simulated array.

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```
1 function wfgeneration, dim, length, L0, r0, lambda, SEED=seed
2 ;
3 ; wave-front (wf) generation following von Karman model
4 ; (infinite L0 -Kolmogorov model- not allowed here).
5 ;
6 ; dim      = wf linear dimension [px],
7 ; length   = wf physical length [m],
8 ; L0       = wf outer-scale [m],
9 ; seed     = random generation seed (OPTIONAL),
10 ; r0       = Fried parameter at wavelength 'lambda' [m],
11 ; lambda   = wavelength at which r0 is defined.
12 ;
13 ; Marcel Carbillot [marcel.carbillot@unice.fr],
14 ; lab. Lagrange (UCA, OCA, CNRS), Feb. 2013.
15 ;
16 ; Last modification: March 2025.
17 ;
18 theta = (randomu(seed,dim,dim)-.5) * 2*!PI    ; rnd uniformly distributed phase
19 ; (=argument), between -PI and +PI,
20 ; of the complex number describing
21 ; the FFT of the phase screen phi
22 freq = dist(dim)                                ; spatial frequency array
23 modul = sqrt(2)*sqrt(.0228)*(length/r0)^(5/6.)*(freq^2+(length/L0)^2)^(-11/12.)
24 ; von Kármán model
25 phi   = fft(modul*exp(complex(0,1)*theta), /INVERSE)
26 ; compute phase screen phi
27 wf    = phi*lambda/(2*!PI)                      ; phase screen phi => wavefront wf
28 wf   -= mean(wf)                                ; force mean to zero
29 ;
30 return, wf                                       ; deliver 2 independent wf:
31 ; float(wf) & imaginary(wf)
32 end
```



wf generation:

generate a cube of statistically independent wf (typically 100)...
=> compute mean *rms* for different $[r_0, L_0]$

Images & turbulence — 19

```
1 function wfcube2, dim, length, L0, r0, lambda, n_wf, filewf
2
3 ;+
4 ; example of use:
5 ; dim      = 128L          ; [px] wf dimension
6 ; length   = 2.            ; [m] wf physical dimension
7 ; L0       = 27.           ; [m] outerscale of turbulence
8 ; r0       = .1             ; [m] Fried parameter
9 ; lambda   = 500E-9        ; [m] r0 wavelength
10 ; n_wf    = 100L           ; nb of generated wf
11 ; filewf   = 'cube.sav'    ; cube of wf filename
12 ;
13 ; print, wfcube2(128L, 2., 27., .1, 500E-9, 100L, 'wf_r0=10cm_L0=10m.sav')*1E9
14 ; -> compute the cube of wf, save it, and print the rms value in nm
15 ;
16 ; sub-routines needed:
17 ; wfgeneration.pro, compute_rms.pro
18 ;
19 ; Marcel Carbillet [marcel.carbillet@unice.fr],
20 ; lab. Lagrange (UCA, OCA, CNRS), Feb. 2018.
21 ; Last modification: 11th March 2024
22 ;-
23
24 ; preliminary
25 cube = fltarr(dim,dim,n_wf) ; initialize cube of wf
26
27 ; compute and save cube of wf
28 for i=0, n_wf/2-1 do begin ; generate wf
29     wf = wfgeneration(dim, length, L0, r0, lambda, SEED=seed)
30     cube[*,*,2*i] = float(wf)
31     cube[*,*,2*i+1] = imaginary(wf)
32 endfor
33 save, cube, FILE=filewf      ; save cube of wf to disk
34
35 ; compute mean rms
36 rms = compute_rms(cube)      ; compute rms
37
38 return, rms                  ; return back
39 end
```

```
function compute_rms, cube
; cube: cube of wavefronts (square wf, no pupil!)

n_wf = (size(cube))[3]
rms = fltarr(n_wf)

for i=0,n_wf-1 do begin
    toto = moment(cube[*,*,i], SDEV=dummy)
    rms[i] = dummy
endfor

rms_moy = mean(rms)

return, rms_moy
end
```